

# Measured Data are Uncertain: So What??

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# Uncertainty in H/WQ Data

**“Should it not be required that every... (field and modeling study)... attempt to evaluate the uncertainty in the results?”**

**Beven (2006)**

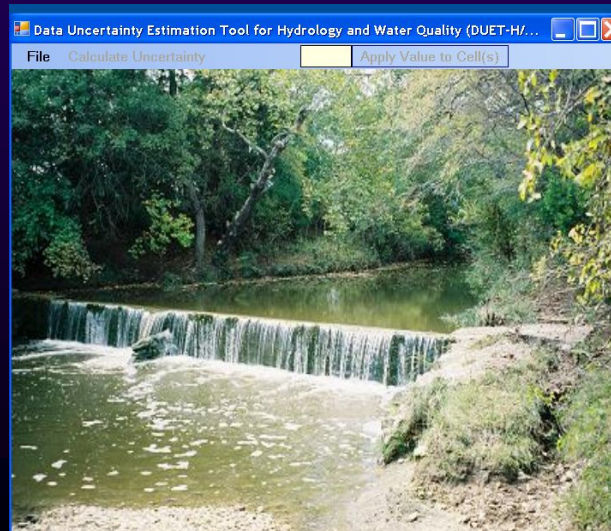
**“The use of uncertainty estimation... (should be)... routine in hydrological and hydraulic science.” Pappenberger, Beven (2006)**

- **Uncertainty in H/WQ data is most often ignored in spite of:**
  - **Such pleas for uncertainty analysis**
  - **Fact that all measurements are inherently uncertain.**



# DUET- H/WQ

- Developed uncertainty estimation framework (2006)
  - focused on Q, TSS, N, and P data for small watersheds
  - listed published uncertainty estimates in 4 categories
    - discharge, sample collection, preservation/storage, lab analysis
- Developed DUET-H/WQ to be more user-friendly (2009)
  - added “data processing and management” procedural category



# DUET- H/WQ

- Uses the RMSE method to determine uncertainty
  - contributed by each procedural category
  - for individual measured discharge, concentration, load values

DUET-H/WQ - LookUp Table for calculation of uncertainty in discharge measurement

Select the published value for each step or source of uncertainty

Individual discharge measurement	Uncertainty	Reference
Direct - area-velocity method - poor conditions	±20%	Sauer and Meyer (1992)
Direct - area-velocity method - average conditions	±6%	Sauer and Meyer (1992)
Direct - area-velocity method - ideal conditions	±2%	Sauer and Meyer (1992)
Direct - area-velocity method - ideal conditions	±2%	Boning (1992)
Direct - area-velocity method - ideal conditions (0.2, 0.8d velocity)	±6.1%	Pelletier (1988)
Direct - area-velocity method - ideal conditions (0.6d velocity)	±8.5%	Pelletier (1988)
Manning's equation - Stable, uniform channel; surveyed reach and cross-section; accurate "n" estimate	±15%	Slade (2004)
Manning's equation - Unstable, irregular channel; surveyed reach and cross-section; poor "n" estimate	±35%	Slade (2004)
Direct - area-velocity method	±5% to ±15% (average ±9.3%)	Tillary et al. (2006)

±  %  
(Click to change)

Continuous discharge measurement	Uncertainty	Reference
Pre-calibrated flow control structure (properly designed and installed) with periodic meter checks	±5% to ±8%	Slade (2004)
Pre-calibrated flow control structure (properly designed and installed)	±5% to ±10%	Slade (2004)
Stable channel with stable control, 8-12 stage-discharge measurements per year	±10%	Slade (2004)
Shifting channel, 8-12 stage-discharge measurements per year	±20%	Slade (2004)
Natural channel, ideal conditions	±6%	Boning (1992)
Instream velocity meter	---	N/A
OTHER -	---	N/A

±  %  
(Click to change)

Continuous stage measurement	Uncertainty	Reference
Float recorder	±2%	Cooper (2005), unpublished data
Float recorder	±3 mm	Hershey (1975)
KPSI series 173 pressure transducer	±0.1%, ±0.022% thermal error	KPSI (2005)
ISCO 730 bubbler flow module	±0.035 ft ±0.0003 * ft * temp. change from 72 deg. F	Teledyne ISCO (2005)
Campbell Scientific SR50-L ultrasonic distance sensor	Larger of ±1 cm or 0.4% of distance to water surface	Campbell Scientific (2003)
OTHER -	---	N/A

±  %  
(Click to change)

Effect of streambed condition	Uncertainty	Reference
Stable, firm bed	±0%	Sauer and Meyer (1992)
Mobile, unstable bed	±10%	Sauer and Meyer (1992)
OTHER -	---	N/A

±  %  
(Click to change)

Cancel



# DUET-H/WQ Default Discharge Uncertainty

## Default Discharge Uncertainty

Discharge uncertainty (%)	
Worst case scenario	<input checked="" type="radio"/> 42
Typical scenario maximum	<input type="radio"/> 19
Typical scenario average	<input type="radio"/> 10
Typical scenario minimum	<input type="radio"/> 6
Best case scenario	<input type="radio"/> 3

Cancel

# DUET-H/WQ Default Concentration Uncertainty

## Default Concentration Uncertainty

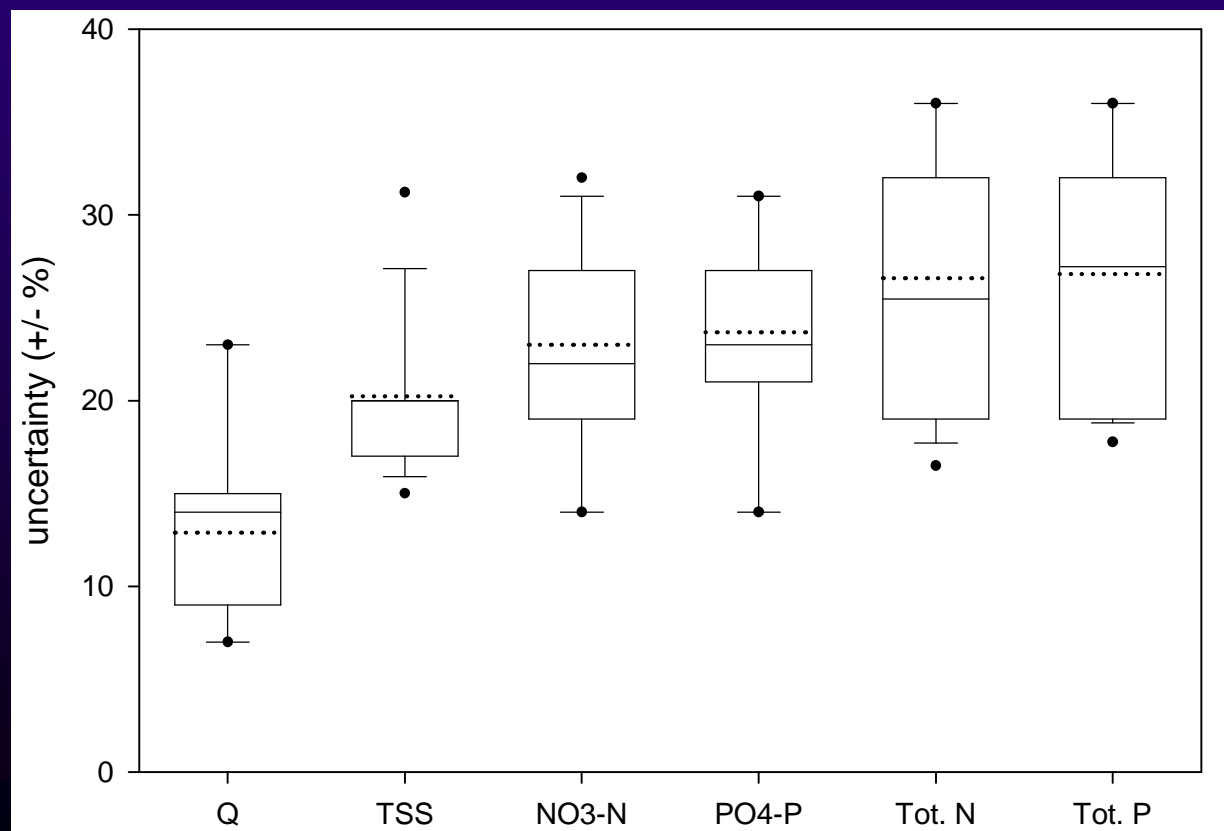
Storm concentration uncertainty	TSS(%)	NO3-N(%)	NH4-N(%)	Total N(%)	Diss. P(%)	Total P(%)
Worst case scenario	<input checked="" type="radio"/> 109	<input type="radio"/> 419	<input type="radio"/> 243	<input type="radio"/> 163	<input type="radio"/> 415	<input type="radio"/> 246
Typical scenario maximum	<input type="radio"/> 50	<input type="radio"/> 67	<input type="radio"/> 99	<input type="radio"/> 67	<input type="radio"/> 102	<input type="radio"/> 109
Typical scenario average	<input type="radio"/> 15	<input type="radio"/> 14	<input type="radio"/> 30	<input type="radio"/> 27	<input type="radio"/> 20	<input type="radio"/> 29
Typical scenario minimum	<input type="radio"/> 4	<input type="radio"/> 6	<input type="radio"/> 9	<input type="radio"/> 9	<input type="radio"/> 10	<input type="radio"/> 6
Best case scenario	<input type="radio"/> 1	<input type="radio"/> 2	<input type="radio"/> 1	<input type="radio"/> 5	<input type="radio"/> 2	<input type="radio"/> 2
Baseflow concentration uncertainty	TSS(%)	NO3-N(%)	NH4-N(%)	Total N(%)	Diss. P(%)	Total P(%)
Worst case scenario	<input type="radio"/> 34	<input type="radio"/> 406	<input type="radio"/> 219	<input type="radio"/> 126	<input type="radio"/> 402	<input type="radio"/> 223
Typical scenario maximum	<input type="radio"/> 18	<input type="radio"/> 48	<input type="radio"/> 87	<input type="radio"/> 48	<input type="radio"/> 91	<input type="radio"/> 98
Typical scenario average	<input type="radio"/> 10	<input type="radio"/> 7	<input type="radio"/> 27	<input type="radio"/> 25	<input type="radio"/> 16	<input type="radio"/> 26
Typical scenario minimum	<input type="radio"/> 1	<input type="radio"/> 4	<input type="radio"/> 8	<input type="radio"/> 8	<input type="radio"/> 9	<input type="radio"/> 4
Best case scenario	<input type="radio"/> 0	<input type="radio"/> 2	<input type="radio"/> 1	<input type="radio"/> 5	<input type="radio"/> 2	<input type="radio"/> 1

Cancel

OK

# DUET- H/WQ Application

- Applied to real-world data sets from five monitoring projects
  - various hydrologic settings, land uses, watershed sizes, and field and laboratory techniques
  - 131 storm events
- Estimated uncertainty for:
  - Q
  - TSS
  - NO<sub>3</sub>-N, PO<sub>4</sub>-P
  - total N, total P



# Measured Data are Uncertain: So What??

- Applies to:
  - Technical staff (laboratory, field, QA/QC)
  - Researchers, modelers
  - Agency personnel, consultants
  - Policy makers, regulators, stakeholders
- Related to:
  - Research and monitoring
  - Data reporting
  - Regulation and policy
  - Model evaluation



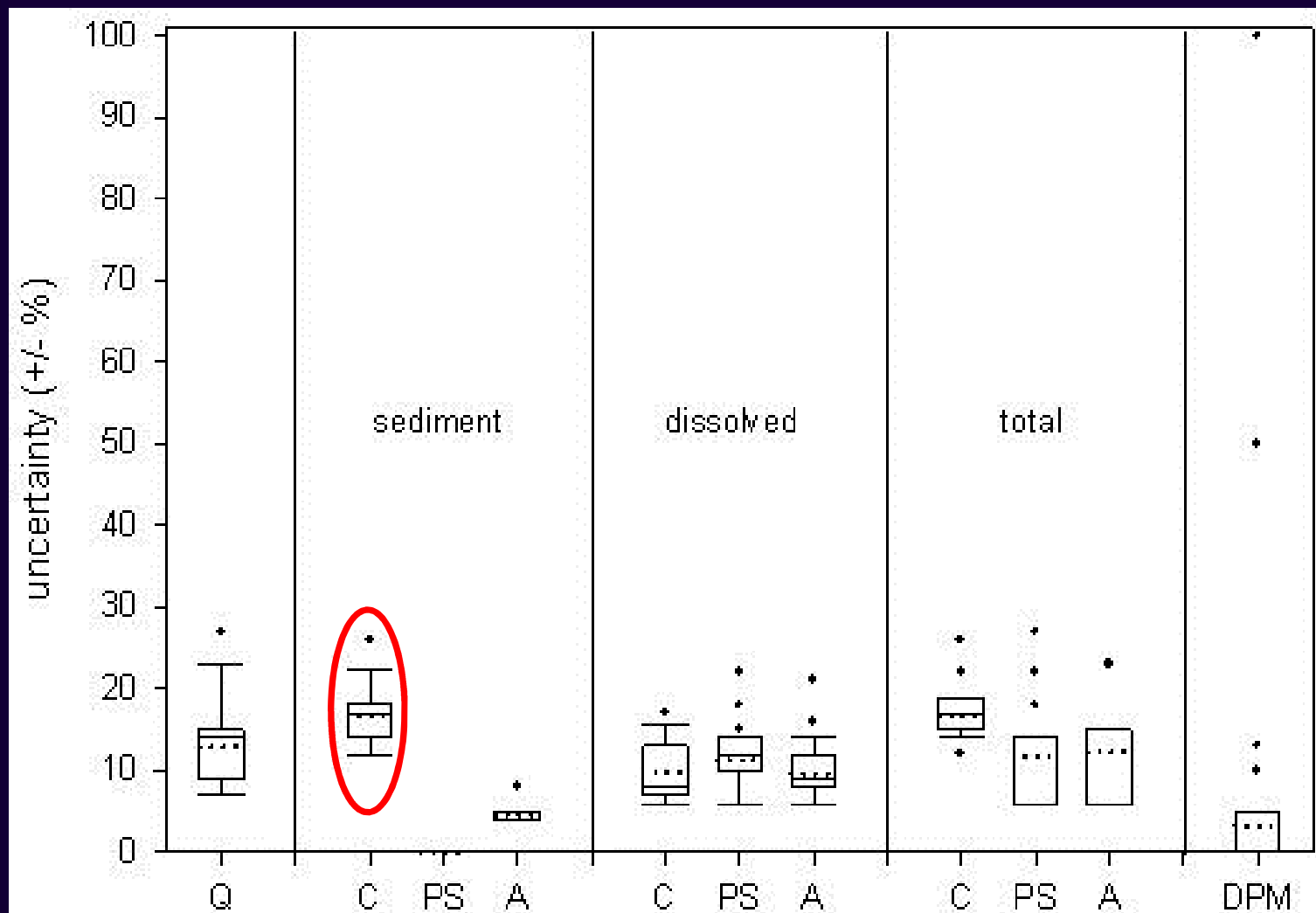
# Research and Monitoring

- **Difficulties:**
  - H/WQ data collection already a difficult task (storm events, remote sites).
  - Disagree about which uncertainty estimation method to use.
- **Benefits:**
  - Focus QA/QC on steps/procedures with greatest uncertainty.
  - Support training on proper field and laboratory techniques.
  - Balance project resources with data quality concerns.

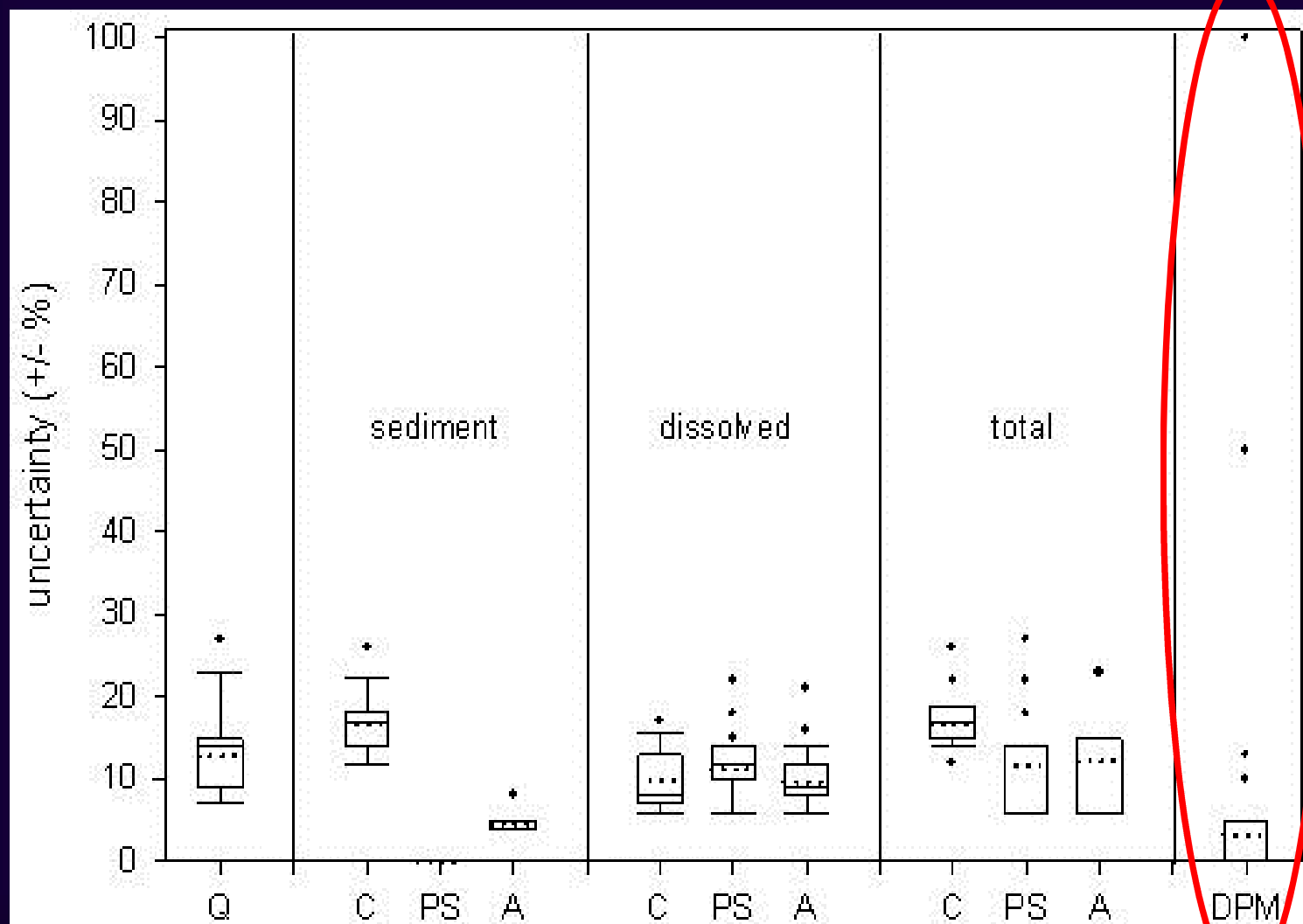




# Research and Monitoring



# Research and Monitoring

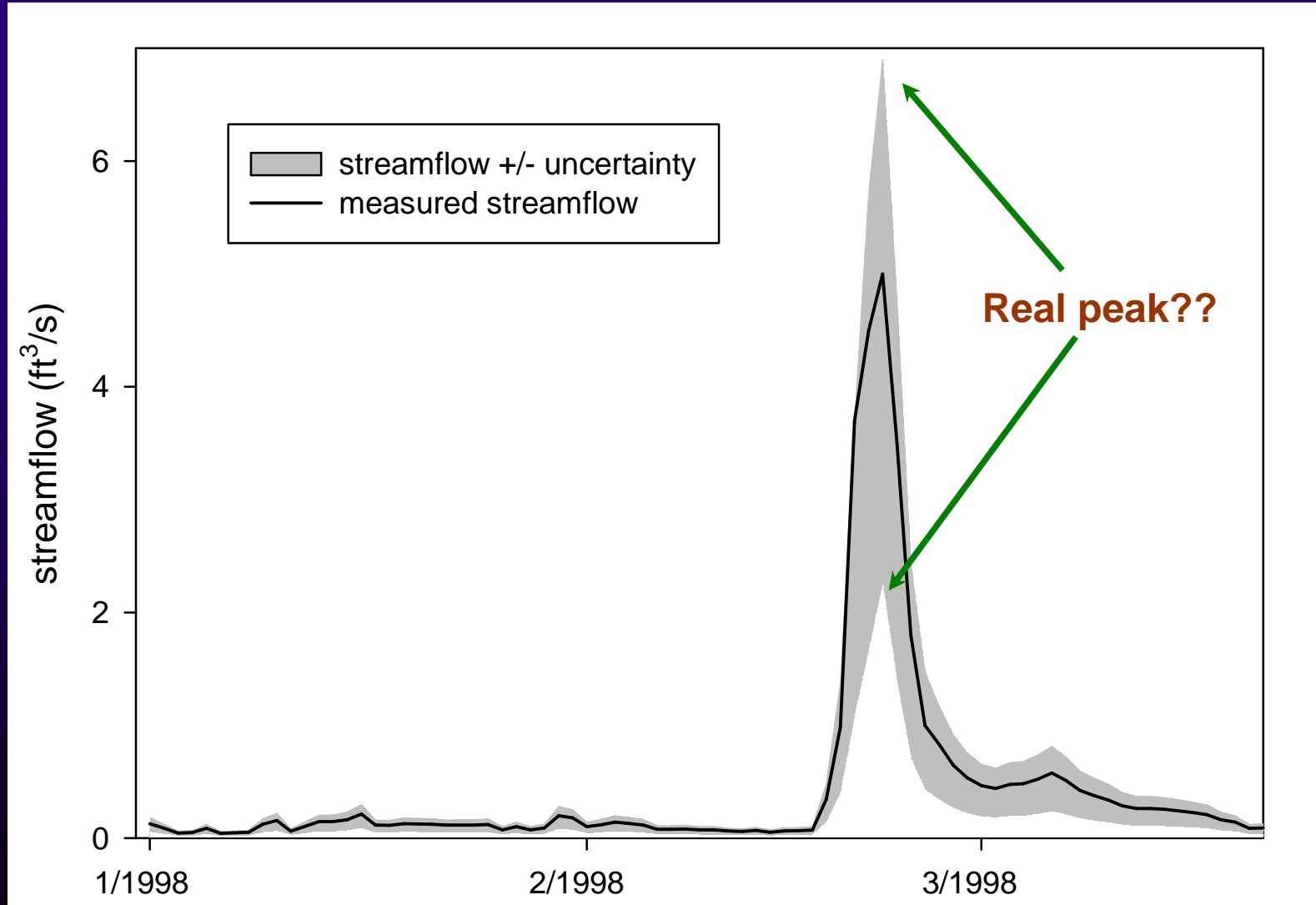


# Data Reporting

- **Difficulties:**
  - Fear of negative perception if report data with “high” uncertainty.
  - Belief that public, stakeholders, elected officials can not understand uncertainty.
- **Benefits:**
  - Certain value of data with corresponding uncertainty estimates.
  - Scientific integrity - should be honest about what you know and what you don't know.



# Data Reporting



# Regulation and Policy

- **Difficulties:**

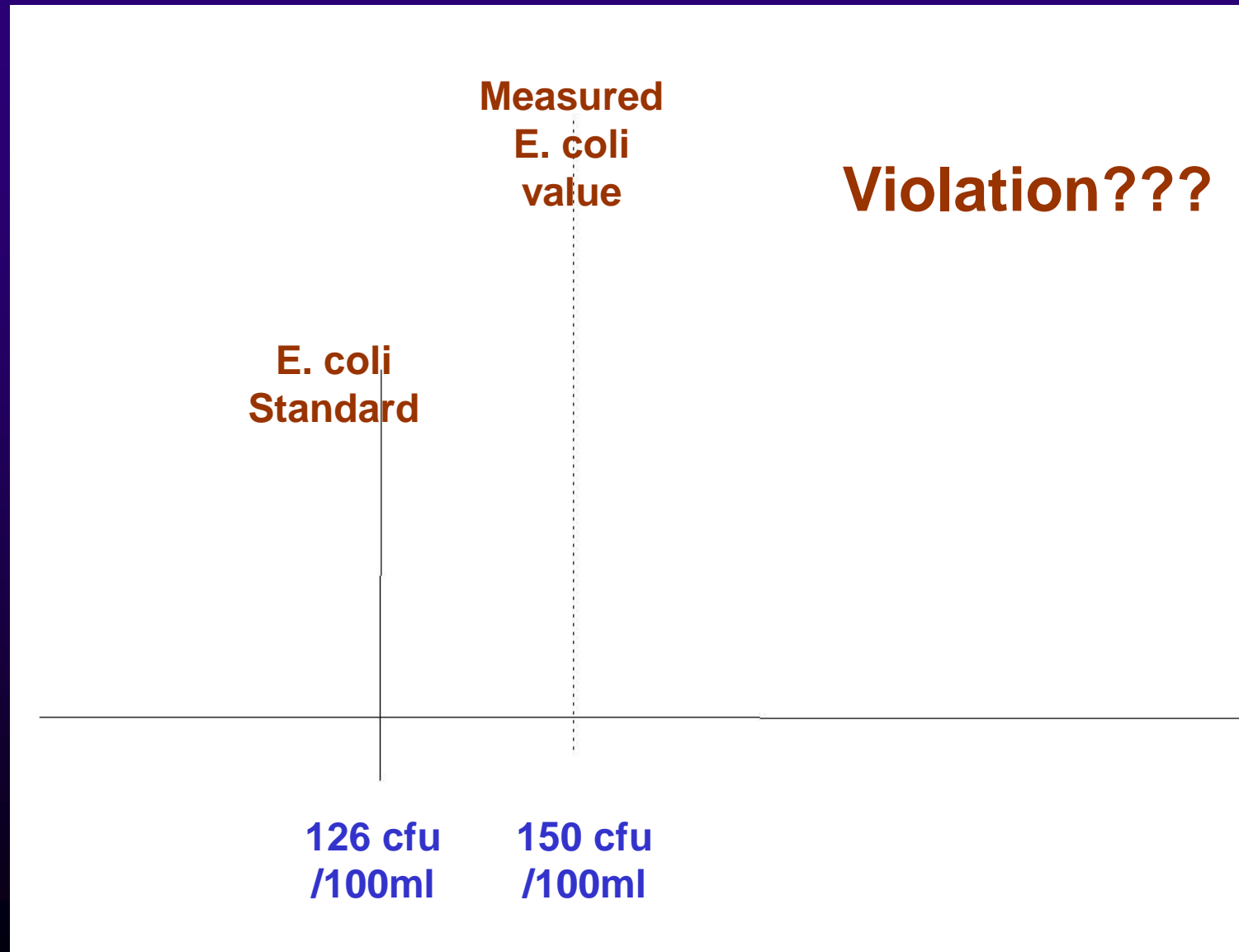
- A great deal of written information competes for readers' attention
  - therefore, only briefs/abstracts are typically read.
- Opponents search for weak points to attack unwelcome conclusions and undermine author credibility
  - therefore, difficult to appropriately present uncertainty without drawing attention to the inaccuracy of measurements.

- **Benefits:**

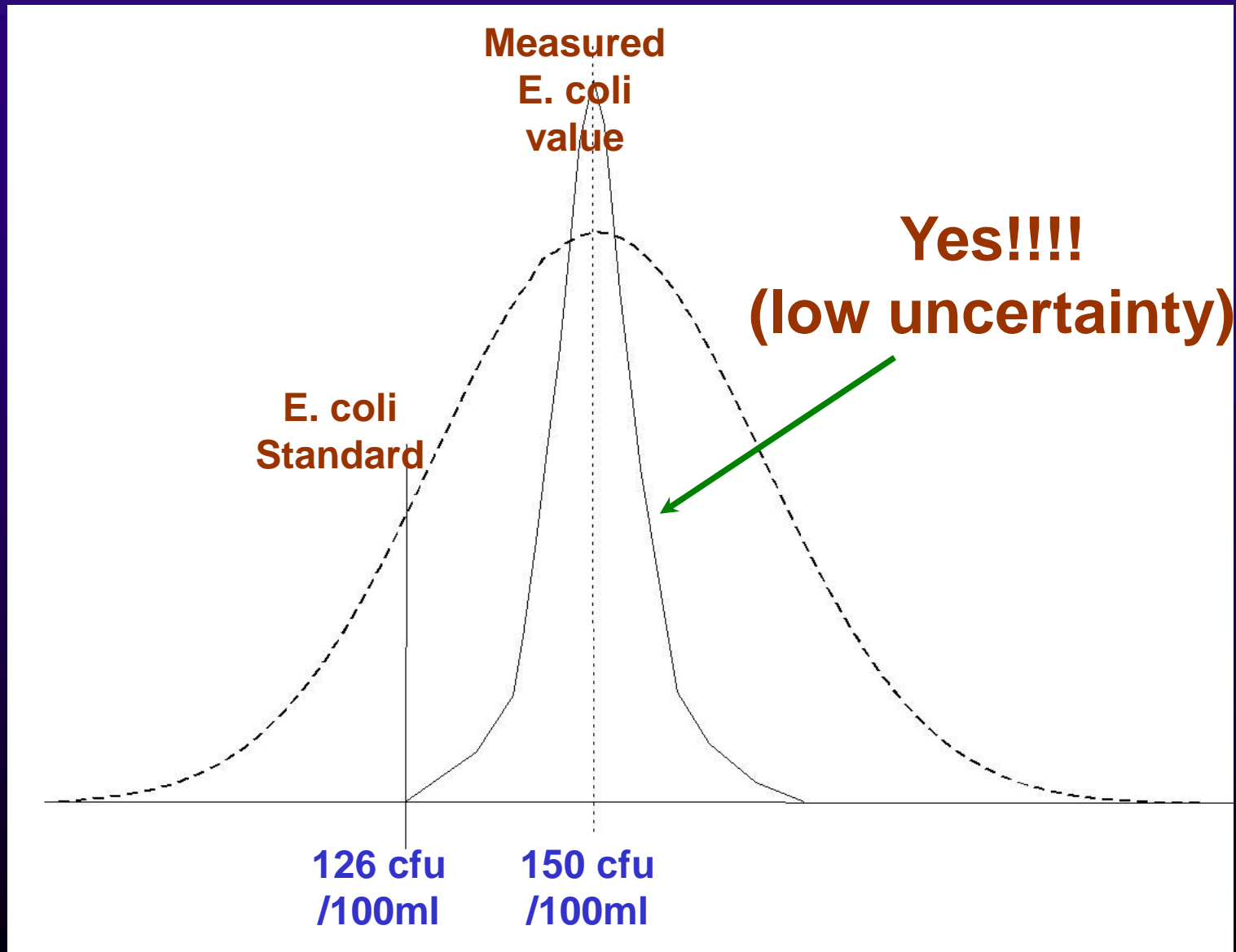
- Choose different (more cost-effective) policy or regulatory pathway depending on uncertainty in measured data.
  - “low” uncertainty - strict regulation/enforcement may be justified
  - “high” uncertainty - adaptive management approach preferred



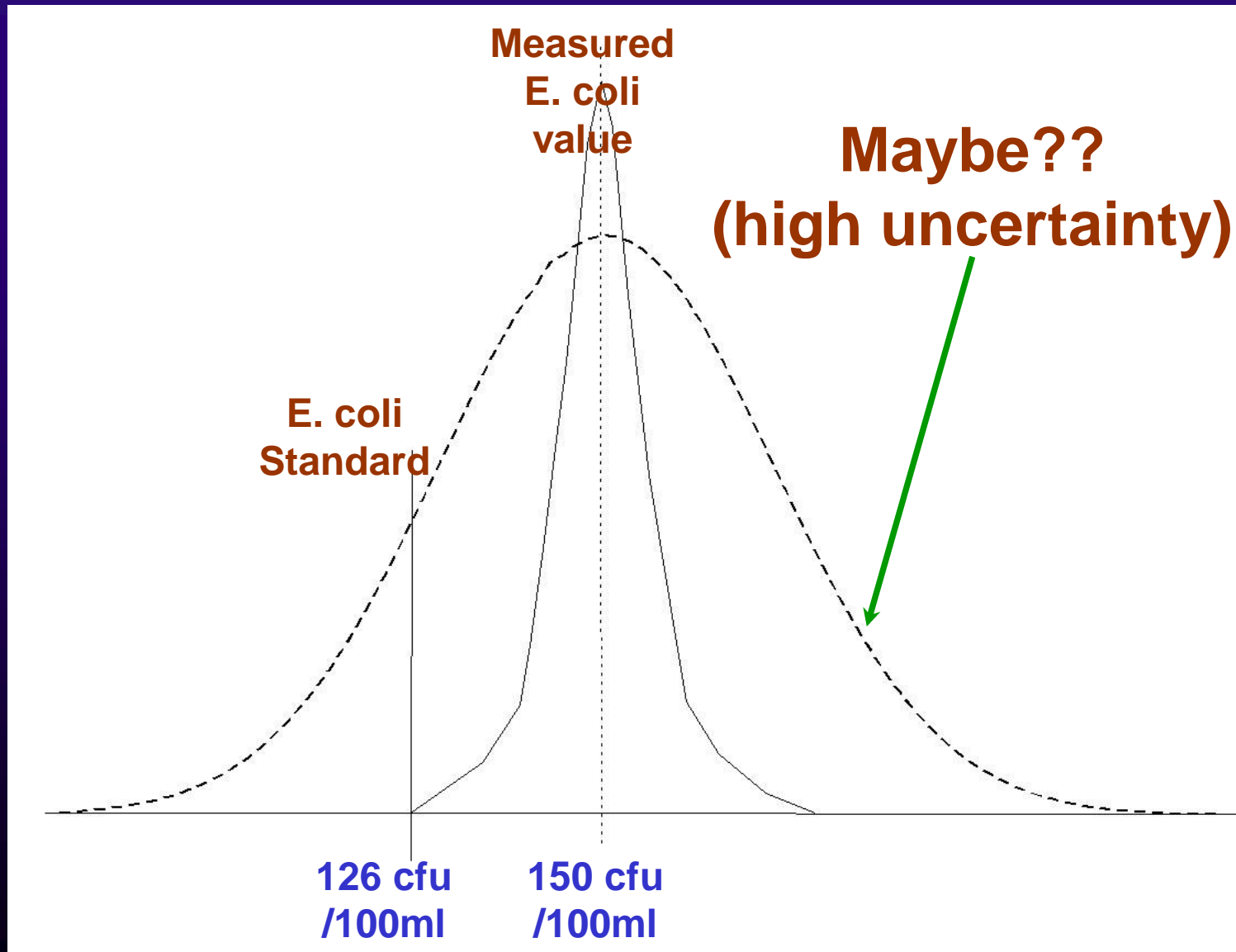
# Regulation and Policy



# Regulation and Policy

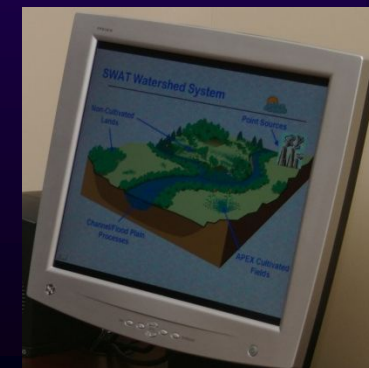


# Regulation and Policy

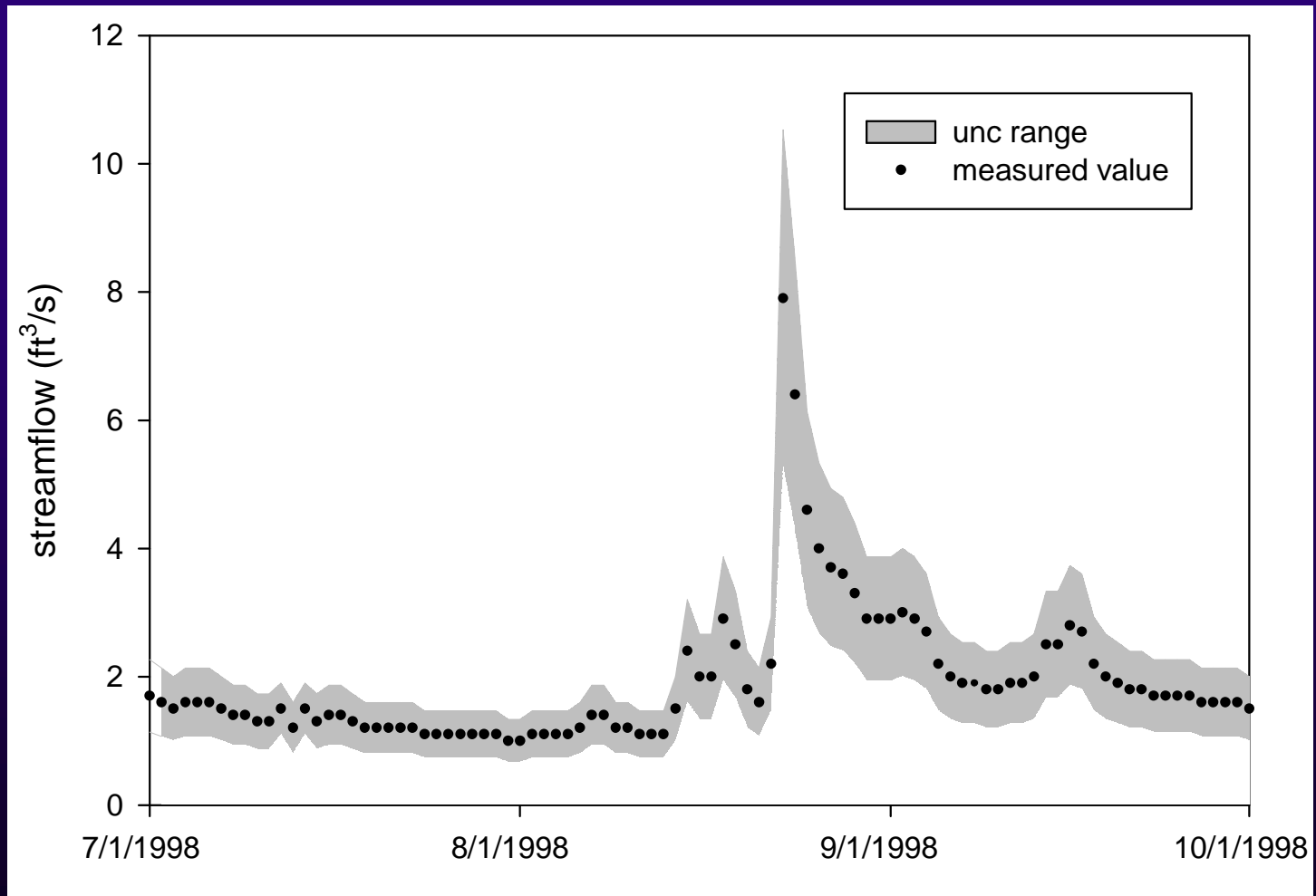


# Model Evaluation

- **Difficulties:**
  - No simple “click a button” method (hopefully soon).
- **Benefits:**
  - Appropriately share burden with “data providers.”
  - Conduct more realistic evaluations of model performance.
  - Help prevent “over fitting.”
  - Allow modelers to focus on model deficiencies.
  - More accurately communicate model performance
    - stakeholders, policy makers, regulators.

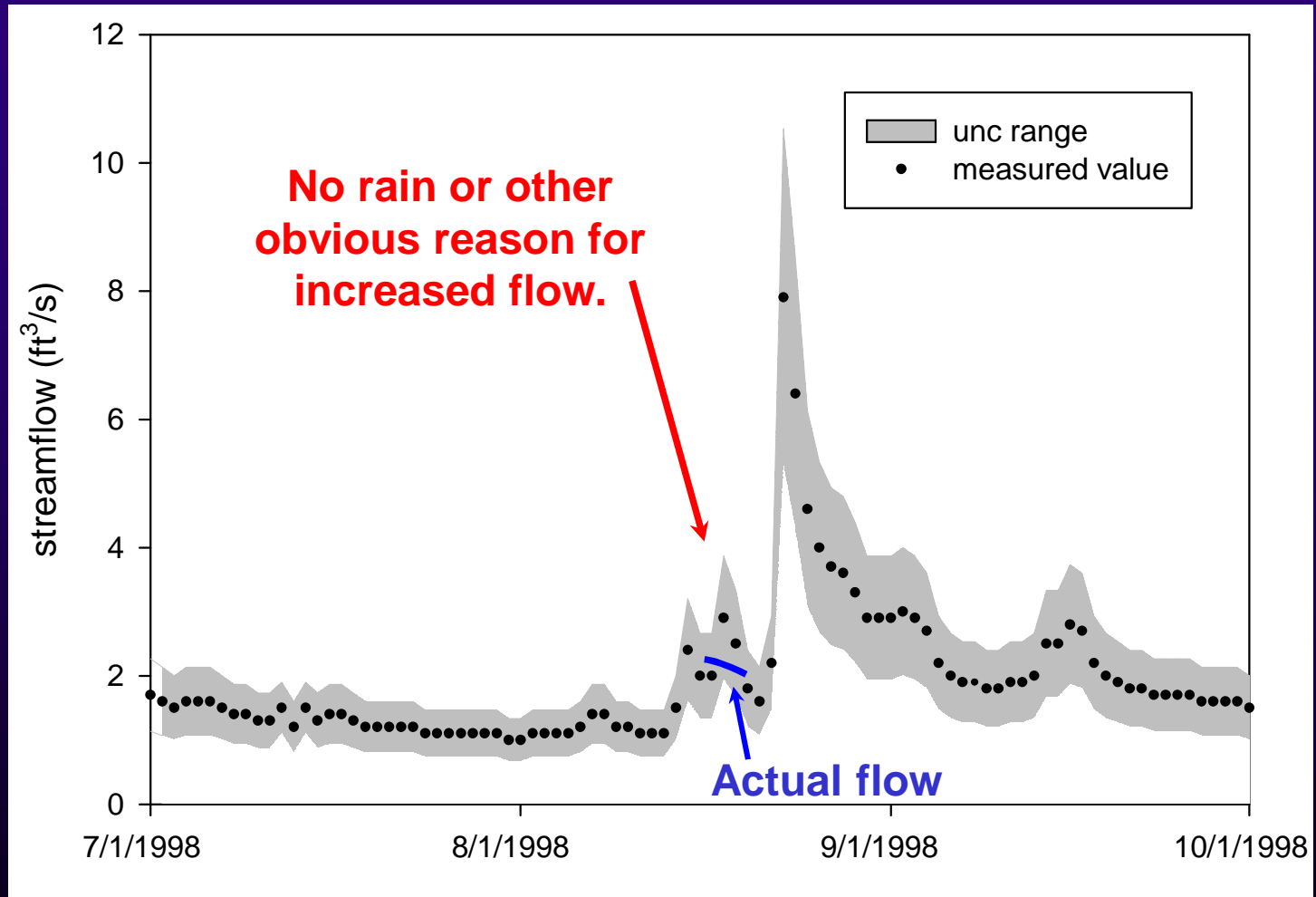


# Model Evaluation





# Model Evaluation



# Conclusions

- Historically, uncertainty in measured H/WQ data was rarely estimated and included in:
  - Research and monitoring
  - Data reporting
  - Regulation and policy
  - Model evaluation
- However, the environmental and socio-economic ramifications of decisions based on H/WQ data are too great for the inherent uncertainty to continue to be ignored.



**Any Questions??**

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